

Working with Roman CGI Simulated Datasets



Marie Ygouf – Technologist
(she/her/hers)

Jet Propulsion Laboratory, California Institute of Technology

Neil Zimmerman, Vanessa Bailey



Outline



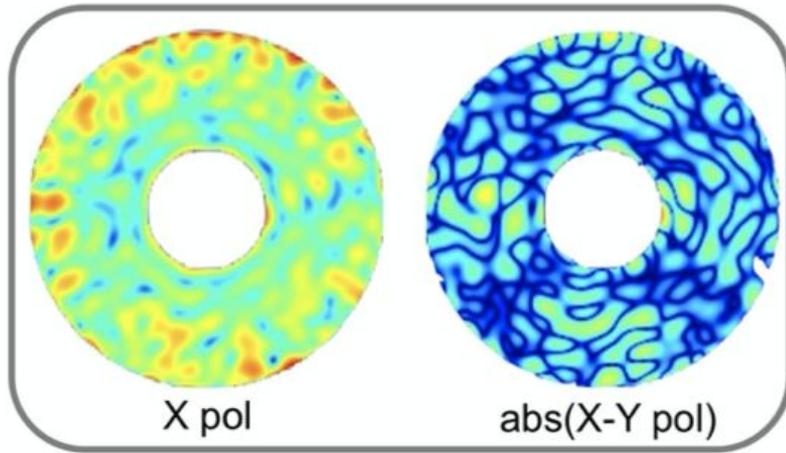
- How is CGI making data processing more challenging than other instruments?
- Steps to process CGI simulated data and associated results
- Work to go and path forward to process Roman CGI images



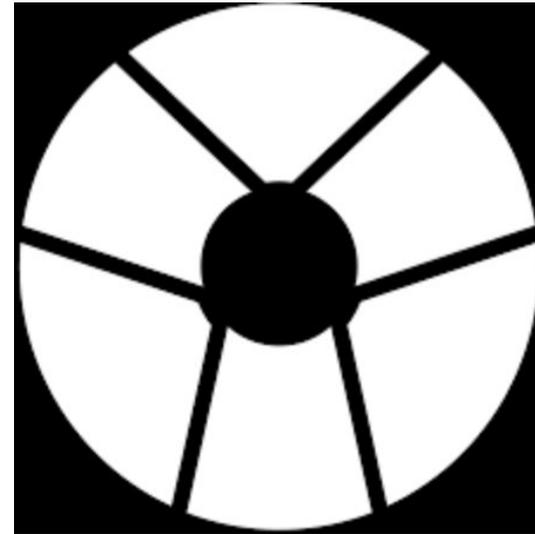
Very high-contrast imaging challenges and implications for data processing - CGI does not drive the Roman mission



- Telescope primary mirror and non-optimal mirror coatings => polarization-dependent speckles, or “polarization aberrations”



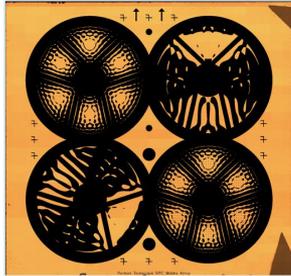
- Roman pupil not optimized for high-contrast imaging



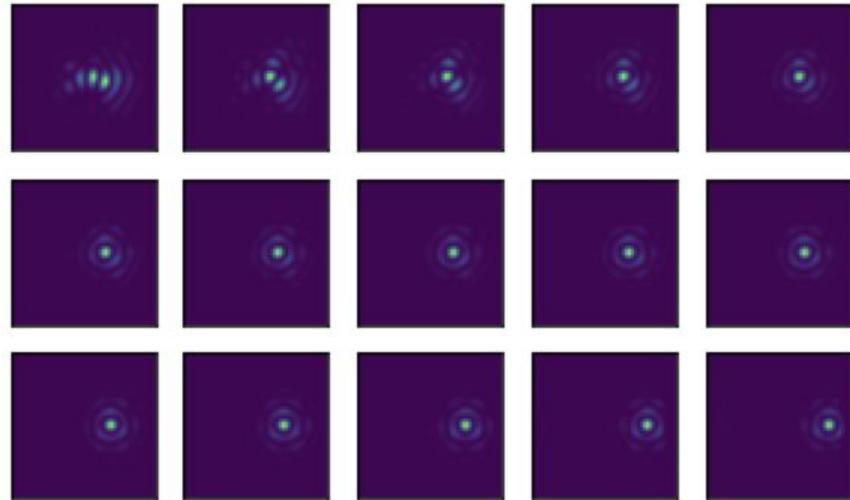
Very high-contrast imaging challenges and implications for data processing - Coronagraphs



- Coronagraphic mask working at very high contrast and a complex aperture, really distorted PSF.
- Implications for calibration, post-processing and analysis of Roman CGI data



CGI coronagraphic masks

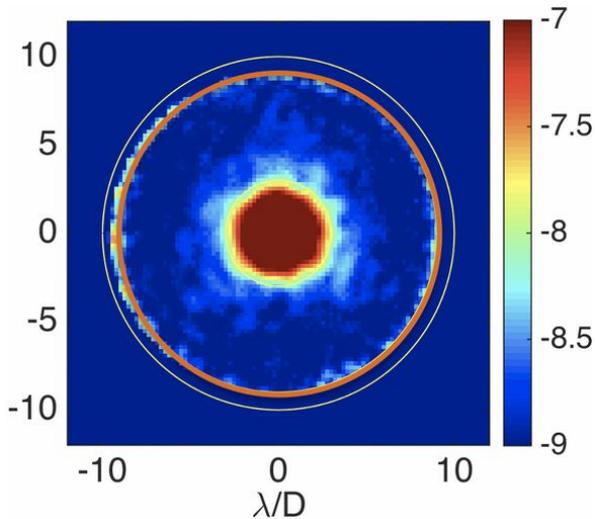


OS9 PSF for different separations from the star,
 $r = 1.0, 2.0, 2.2, 2.4, 2.6, 2.8, 3.0, 3.2, 3.4, 3.6, 3.8, 4.0,$
 $5.0, 6.0, 7.0 \lambda c/D$

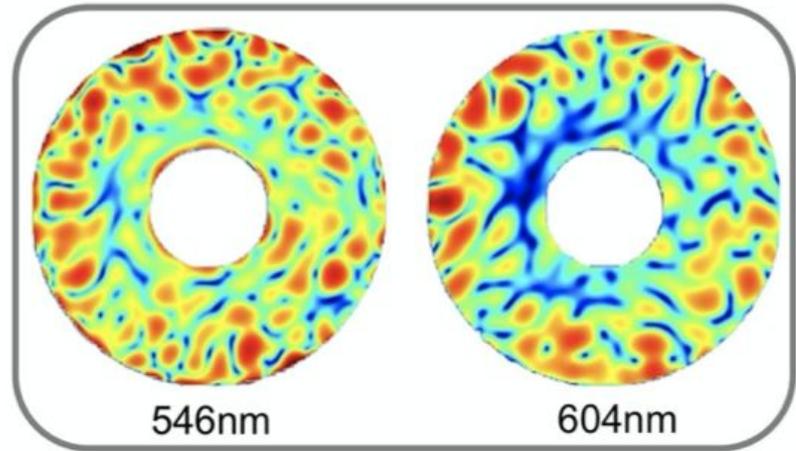
Very high-contrast imaging challenges and implications for data processing - DMs



- DMs used to correct the instrumental aberrations down to raw contrast levels of 10^{-8}



- Implications for the behavior of speckle residuals, which is harder to predict than for standard



Raw experimental image with the hybrid lyot coronagraph showing the dark hole

Bailey et al. 2018

Very high-contrast imaging challenges and implications for data processing - Photon counting



- The need for Photon Counting mode in Roman CGI
 - Cosmic rays limit single-frame integration times to a few hundred seconds and read noise is dominant (100 e-RMS per frame) => unpractical for regular CCDs
 - Roman EMCCD uses signal amplification from a gain register prior to read out to remove read noise.
 - This reduction comes at the cost of an increase (by a factor $\sqrt{2}$), called as Excess Noise Factor (ENF) of all other noises.
- Implications for post-processing
 - Photon-counting must be used to pre-process the high-gain frames in photon-counting mode

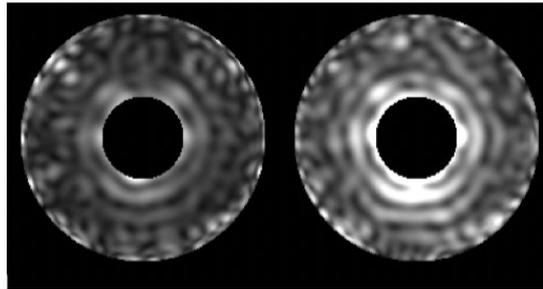
Ultra-low-noise
Photon-counting
EMCCDs



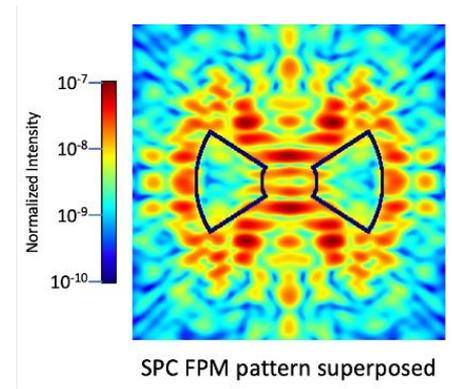


Observing Scenario 9 (OS9) Simulated Dataset

- Residual star light is the limitation of high-contrast imaging what is causing that limitation
- Generated by John Krist (JPL) - Released in May 2020
- Hybrid Lyot Coronagraph Band 1 – (Phase B design) (10% band at 575nm)
- Shaped Pupil Coronagraph Band 3 – (Phase B design) (15%, 675 – 785 nm, $\lambda_c=730$ nm) – Bowtie FPM



HLC - No Sensitivity MUFs HLC - With Sensitivity MUFs



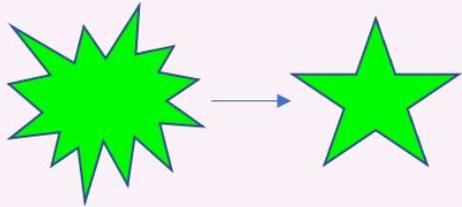


OS9 Observing Strategy

- 47 Uma (V=5.0 mag, GIV) - ζ Pup (V=2.25 mag, O4I)
- RDI & ADI (22° roll)
- Repeat observation cycle 3 times (HLC) or 14 times (SPC spectrum)

Calibration – Digging Dark Hole

ζ Pup



Chopping between target and reference star + two telescope rolls for the target

ζ Pup

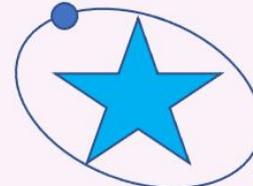


47 UMa



Roll 1 -11°

47 UMa



Roll 2 +11°

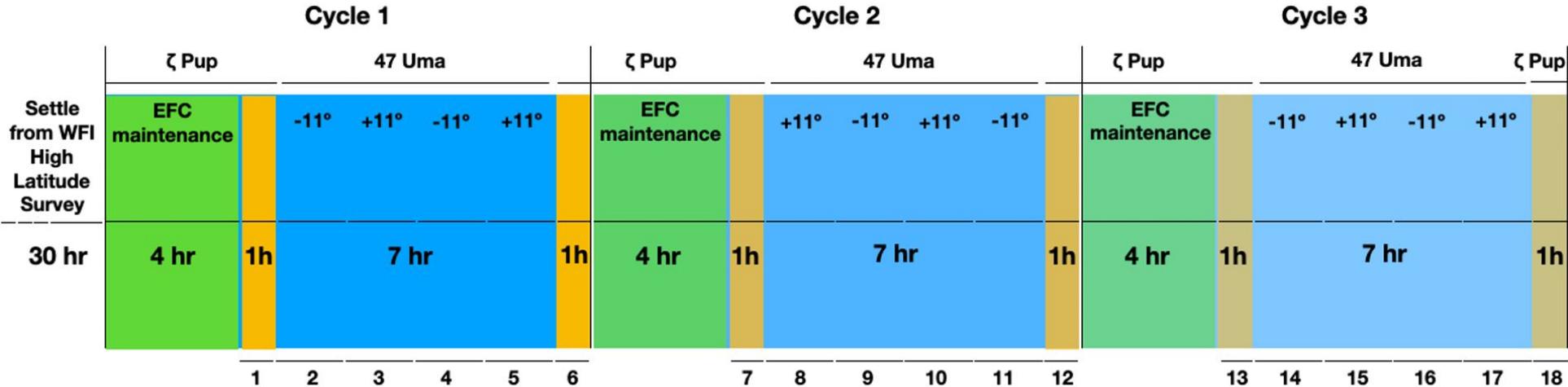
ζ Pup





OS9 HLC Generated image time sequences

- ~20 hours on target 47 Uma, ~6 hours on reference ζ Pup
- 335 reference frames (100s each), 7080 and 7320 target star frames at roll 1 and roll 2 respectively (5s each)



OS9 HLC Datasets



File name	MUFs	Noise	Planets	Flux Units
os9_noiseless_ccd_images_no_planets.fits	-	-	-	average flux units
os9_noiseless_ccd_images_with_planets.fits	-	-	✓	average flux units
os9_ccd_images_no_planets.fits	-	✓	-	EMCCD counts
os9_ccd_images_with_planets.fits	-	✓	✓	EMCCD counts
muf_os9_noiseless_ccd_images_no_planets.fits	✓	-	-	average flux units
muf_os9_noiseless_ccd_images_with_planets.fits	✓	-	✓	average flux units
muf_os9_ccd_images_no_planets.fits	✓	✓	-	EMCCD counts
muf_os9_ccd_images_with_planets.fits	✓	✓	✓	EMCCD counts

Table from Observing Scenario 9 Post-Processing report. (Ygouf et al.)

https://wfirst.ipac.caltech.edu/sims/Coronagraph_public_images.html#CGI_OS9_report



Pre-Processing

- Step 1: Data extraction
- Step 2:
 - Photon-counting procedure for "photon-counting" mode data
 - Gain correction for analog mode data
- Step 3: Normalization



Step 1 Pre-Processing - Data extraction

- Modeling Timesteps for target 47 UMa and reference ζ Pup.
- The entire observing sequence is 25.58 hours long (excluding the EFC maintenance) and 37.58 hours long (including the EFC maintenance, not described in this table).
- Data corresponding to the EFC maintenance are not included in the OS9 distribution.

Cycle #	Target pointing #	Target	Roll angle (°)	Exp. time/frame (sec)	# of frames	Total Exp. Time (sec)
1	1	ζ Pup	-11	60	60	3600
	2	47 UMa	-11	5	1020	5100
	3	47 UMa	+11	5	1260	6300
	4	47 UMa	-11	5	1260	6300
	5	47 UMa	+11	5	1260	6300
	6	ζ Pup	+11	60	65	3900
2	7	ζ Pup	+11	60	60	3600
	8	47 UMa	+11	5	1020	5100
	9	47 UMa	-11	5	1260	6300
	10	47 UMa	+11	5	1260	6300
	11	47 UMa	-11	5	1260	6300
	12	ζ Pup	-11	60	65	3900
3	13	ζ Pup	-11	60	60	3600
	14	47 UMa	-11	5	1020	5100
	15	47 UMa	+11	5	1260	6300
	16	47 UMa	-11	5	1260	6300
	17	47 UMa	+11	5	1260	6300
	18	ζ Pup	+11	60	25	1500
Total					14735	92100

Table from Observing Scenario 9 Post-Processing report. (Ygouf et al.)

https://wfirst.ipac.caltech.edu/sims/Coronagraph_public_images.html#CGI_OS9_report

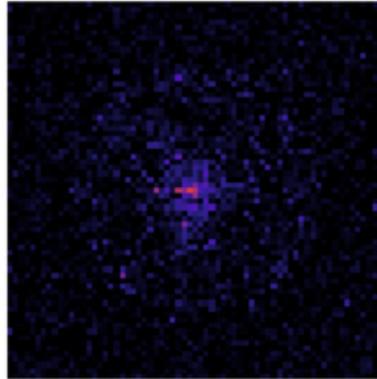


Step 2 Pre-processing - Photon counting mode

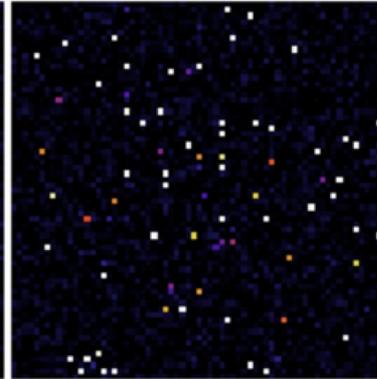
- Photon-counting mode data are high gain analog data

Analog data, 60 sec exposure time / frame Data in photon-counting mode, 5 sec exposure time per frame

Reference first frame



Target Roll -11° first frame



Gain = 100

Gain = 6000



Photon counting mode

- In photon counting mode any pixels with counts below the threshold are recorded as zero electrons, while any above are recorded as one electron.
- Photon Counting rejects read noise and eliminates ENF at the expense of some efficiency loss:
 - Threshold loss. This loss occurs when we record zero electrons when there actually was 1 (or more) image electrons.
 - Coincidence loss. This loss occurs when we record 1 electron, but there were in fact multiple electrons in the image pixel

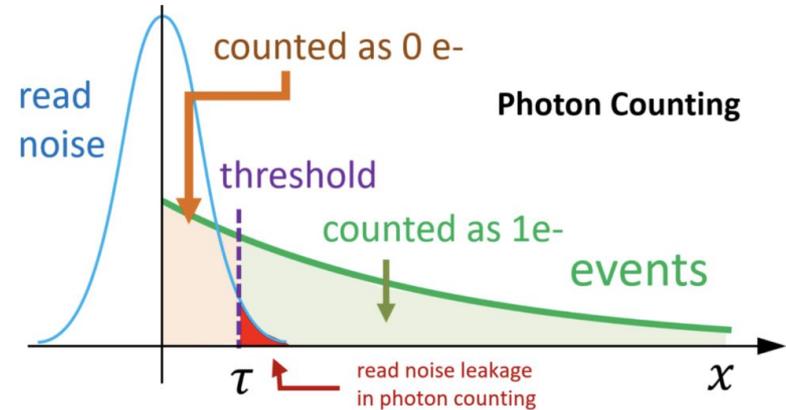
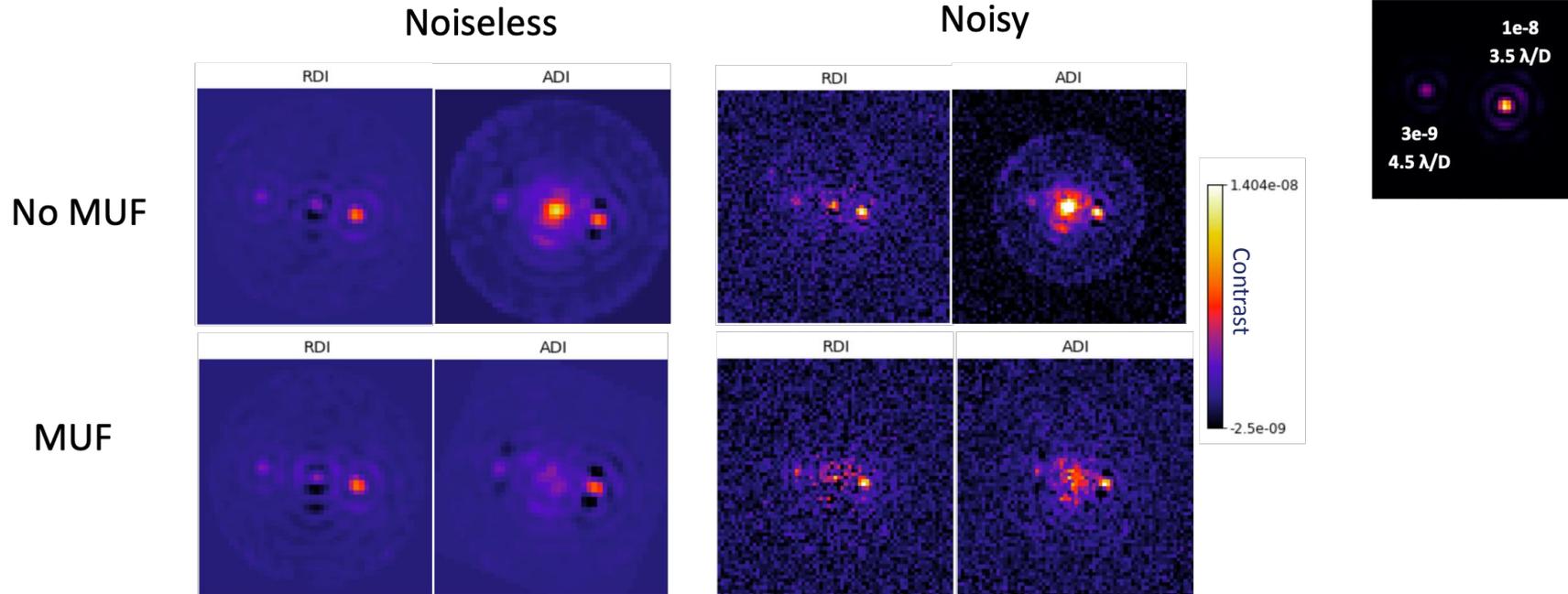


Figure from Nemati et al. 2020

- Photon counting mode procedure
 - Apply a threshold to each frame
 - Apply correction factor for thresholding and coincidence losses
 - Coadding the frames and obtain the pre-processed data

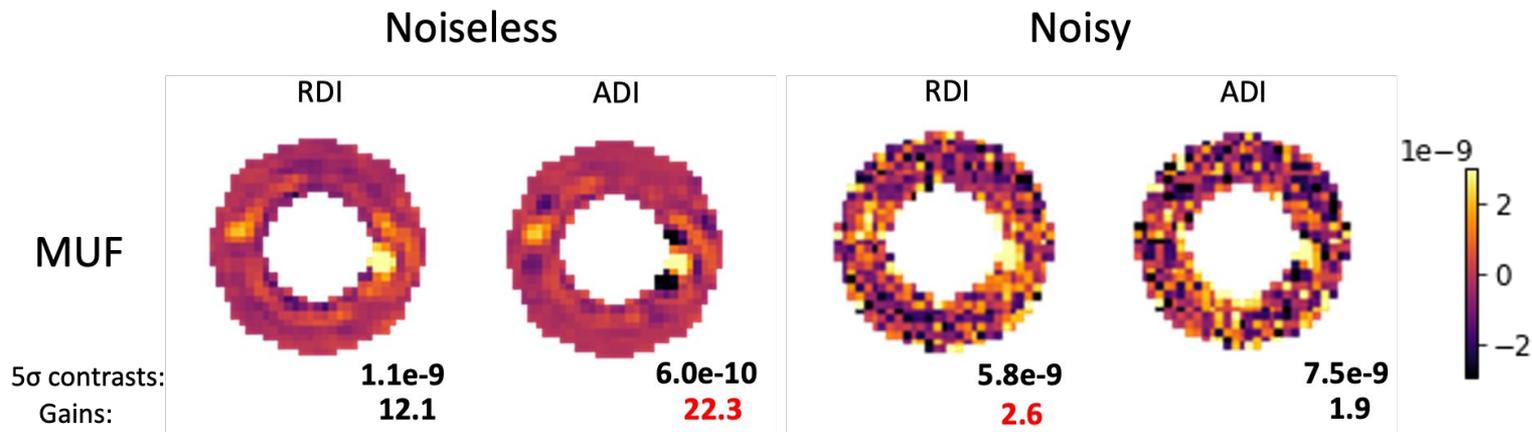
OS9 HLC data processed with classical PSF subtraction



OS9 HLC data processed with classical PSF subtraction



~20 hrs on
"science"
target 47 UMa





OS9 HLC data - Factor above classical (FAC)

~20 hrs on
"science"
target 47 UMa

Noiseless

Noisy

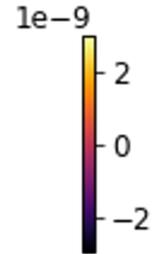
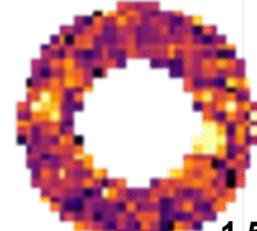
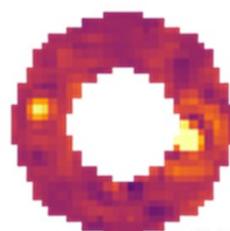
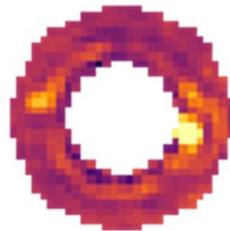
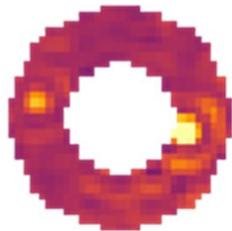
MUF

Class. RDI Single roll
-11°

Class. RDI combined
rolls

KLIP RDI combined
rolls

KLIP RDI combined
rolls



Gains:

12.9

12.1

24.7

1.5

FAC:

2.0

1.2



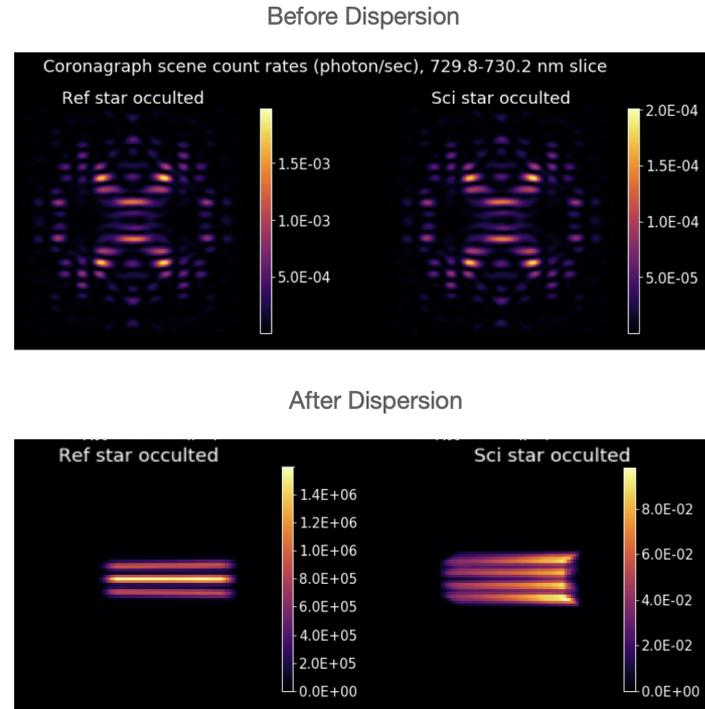
OS9 HLC data - Conclusions

- Performance of post-processing techniques on OS9 HLC data better than design requirement 10σ contrast of $5e-8$
- With a total exposure time on target of only ~ 20 hours, noise is the limiting factor.
- Integrated gain between 3 and 5 λ/D from classical PSF subtraction ranges from ~ 2 to ~ 22 depending on the considered case
- ADI performs better in the noiseless case (speckle dominated) and RDI performs better in the noisy case (noise dominated)
- Factor above classical of 2.0 in the MUF noiseless case (speckle dominated)
- Factor above classical of 1.2 in the no MUF noisy case (noise dominated)



Generating OS9 SPC Band 3 Spectroscopic Data

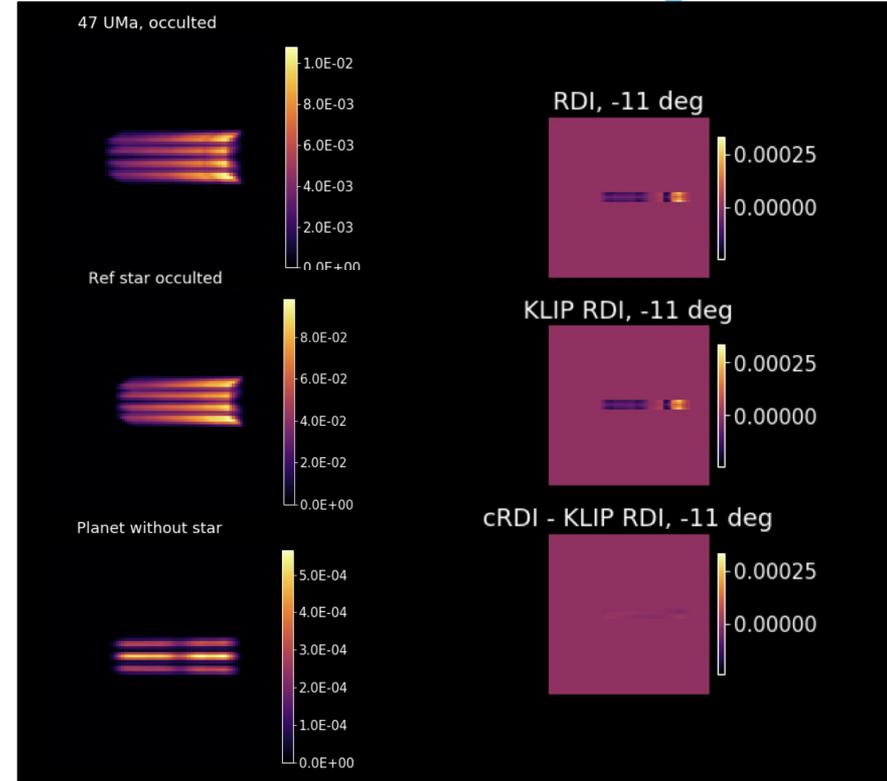
- Goal: Compute the factor above classical for SPC Band 3
 - Used python code developed by Neil Zimmerman and Hari Subedi (GSFC)
 - Takes as input SPC OS9 simulations to create star scenes based on a specified target star apparent mag and spectral type
 - Apply the specified prism dispersion profile to the occulted science and reference stars





Factor above classical for SPC Band 3

- Applied classical PSF subtraction (cRDI) and KLIP RDI (6 PC) on noiseless OS9 SPC spectroscopic data
- Preliminary Results:
 - KLIP throughput computed by propagating a dispersed offset PSF at the location of the planet through the KLIP algorithm
 - With this KLIP throughput taken into account, the factor above classical is 0.8 and thus cRDI performs better than KLIP RDI.
- Ideas for mitigation:
 - Select regions of the spectrum that are just above or just below the central lobes of the planet LSF
 - Take into account the presence of the planet while processing data





Conclusions

- CGI is not your typical high-contrast imaging instrument and presents some challenges for data processing
- PSF-subtractions techniques have been successfully implemented on simulated data from various OS and will be used as a baseline for the Roman CGI post-processing pipeline
- Work to go includes every aspect of data processing (pre-processing/calibration, post-processing and analysis)



Limitations and work to go

- Post-processing strategy:
 - Further optimize the post-processing parameters and regions used for the projection
 - Frame selection
- Further investigate whether PCA can improve spectroscopy results
- Post-processing of polarimetric data
- Pre-processing / calibration;
 - Develop algorithms to process calibration data
 - Develop algorithms to process data from level 2 data products to level 4 data products
- Analysis:
 - Implement photometry/astrometry using the library of PSFs (matched filter). Was done for older OS but not for OS9 and not implemented in current pipeline
 - Uncertainties estimations on photometry/astrometry (including uncertainties on the spectrum for spectroscopic data)
 - Further improve and implement useful analysis tools and performance metrics (including the use of telemetry data)

Resources

See also data simulation and processing talks by:

- John Krist - Overview of Observing Scenarios and Their Simulated Datasets
- Jessica Gersh-Range - Simulated Datasets for the "Wide" Field of View Shaped Pupil Coronagraph
- Neil Zimmerman - Spectroscopy Data Simulations
- John Debes - Disks and Exozodi: Science Case and PSF subtraction results
- Julien Girard - Exoplanet Imaging Community Data Challenge



- OS9 Simulated data:
 - https://wfirst.ipac.caltech.edu/sims/Coronagraph_public_images.html#CGI_OS9
- Observing Scenario 9 Post-Processing report:
 - https://wfirst.ipac.caltech.edu/sims/Coronagraph_public_images.html#CGI_OS9_report
- Exoplanet Data Challenge:
 - https://roman.ipac.caltech.edu/sims/Exoplanet_Data_Challenges.html
- Roman CGI parameters:
 - https://wfirst.ipac.caltech.edu/sims/Param_db.html
- Older post-processing reports:
 - OS5: Zimmerman et al., [WFIRST Coronagraph Instrument post-processing algorithms for advanced PSF subtraction.pdf](#)
 - OS5: Ygouf et al., https://www.stsci.edu/files/live/sites/www/files/home/roman/_documents/WFIRST-STScI-TR1605.pdf
 - OS1 & OS3: Ygouf et al., https://www.stsci.edu/files/live/sites/www/files/home/roman/_documents/WFIRST-STScI-TR1601A.pdf
 - Ygouf et al., https://www.stsci.edu/files/live/sites/www/files/home/roman/_documents/WFIRST-STScI-TR1503A.pdf
- Papers:
 - "The Roman exoplanet imaging data challenge: a major community engagement effort", in SPIE Conference Series, J. Girard et al., 2020
 - "Data processing and algorithm development for the WFIRST-AFTA coronagraph", in SPIE Conference Series, M. Ygouf et al., 2016
 - "WFIRST-AFTA Coronagraphic Operations: Lessons Learned from the Hubble Space Telescope and the James Webb Space Telescope", J. H. Debes, M. Ygouf et al., , in JATIS, 2015
 - "Lessons for WFIRST CGI from ground-based high-contrast systems", in SPIE Conference Series, V. Bailey et al., 2018